

# The MediaEval 2013 Affect Task: Violent Scenes Detection\*

Claire-Hélène Demarty  
Technicolor  
Rennes, France  
claire-  
helene.demarty@technicolor.com

Cédric Penet  
Technicolor  
Rennes, France  
cedric.penet@technicolor.com

Markus Schedl  
Johannes Kepler University  
Linz, Austria  
markus.schedl@jku.at

Bogdan Ionescu  
University Polytechnica of  
Bucharest  
Romania  
bionescu@imag.pub.ro

Vu Lam Quang  
University of Science,  
VNU-HCMC  
Vietnam  
lamquangvu@gmail.com

Yu-Gang Jiang  
Fudan University  
China  
yugang.jiang@gmail.com

## ABSTRACT

This paper provides a description of the MediaEval 2013 Affect Task Violent Scenes Detection. This task, which is proposed for the third year to the research community, derives directly from a Technicolor use case which aims at easing a user's selection process from a movie database. This task will therefore apply to movie content. We provide some insight into the Technicolor use case, before giving details on the task itself, which has seen some changes in 2013. Dataset, annotations, and evaluation criteria as well as the required and optional runs are described.

## 1. INTRODUCTION

The Affect Task Violent Scenes Detection is part of the MediaEval 2013 benchmarking initiative for multimedia evaluation. The objective is to automatically detect violent segments in movies. This challenge is proposed for the third year in the MediaEval benchmark. It derives from a use case at Technicolor (<http://www.technicolor.com>), which involves helping users choose movies that are suitable for children in their family. The movies should be suitable in terms of their violent content, e.g., for viewing by users' families. Users select or reject movies by previewing parts of the movies (i.e., scenes or segments) that include the most violent moments. In the literature, the detection of violence was not a lot studied [2, 1, 3], until recently when it has gained interest. As most of the proposed methods suffer from a lack of a common and consistent database, and usually use a limited development set, the task was launched to propose a public and common framework for the research community. This year, among other changes, two definitions of violence will be studied, an objective one and a subjective one (see below). The addition of a subjective definition was motivated by the fact that the one from 2012 has proven to lead to annotations which do not correspond to the use case.

## 2. TASK DESCRIPTION

The task requires participants to deploy multimodal features to automatically detect portions of movies containing violent material. For 2013, two definitions of violence are studied.

\*This year, work has been supported, in part, by the Quaero Program <http://www.quaero.org/>.

The first one corresponds to the one used in previous years and was chosen to be as objective as possible. This first definition is the following: violence is defined as "physical violence or accident resulting in human injury or pain". In an attempt to better fit the use case, a second definition is proposed, according to which events of interest are "those which one would not let an 8 years old child see, because they contain physical violence". This year, contrary to the previous challenges, the different runs will alternatively allow the participants to use either only features extracted from the provided DVD, or to use also additional external data (e.g., extracted from the web).

## 3. DATA DESCRIPTION

With respect to the use case, the dataset selected for the developed corpus is a set of 25 Hollywood movies that must be purchased as DVDs by the participants. The movies are of different genres and show different amounts of violence (from extremely violent movies to movies without violence). The content extractable from DVDs consists of information from different modalities, namely, visual information, audio signals and subtitles, and any additional metadata present in the DVDs. From these 25 movies, 18 are dedicated to the training process: *Armageddon*, *Billy Elliot*, *Eragon*, *Harry Potter 5*, *I am Legend*, *Leon*, *Midnight Express*, *Pirates of the Caribbean 1*, *Reservoir Dogs*, *Saving Private Ryan*, *The Sixth Sense*, *the Wicker Man*, *Kill Bill 1*, *The Bourne Identity*, *the Wizard of Oz*, *Dead Poets Society*, *Fight Club* and *Independence Day*. The remaining 7 movies, *Fantastic Four*, *Fargo*, *Forrest Gump*, *Legally Blond*, *Pulp Fiction*, *The God Father 1* and *The Pianist*, will serve as the evaluation set. As in 2011 and 2012, we tried to respect the genre repartition (from extremely violent to non violent) both in the training and evaluation sets.

## 4. GROUND TRUTH

The ground truth<sup>1</sup> was created by several human assessors. In addition to segments containing physical violence (with the two above definitions), annotations also include high-level concepts for the visual and the audio modalities. Each

<sup>1</sup>The annotations, shot detections and key frames for this task were made available by the Fudan University, the Vietnam University of Science, and Technicolor. Any publication using these data should acknowledge these institutions' contributions.

annotated violent segment contains only one action, whenever it is possible. In the cases where different actions are overlapping, the whole segment is proposed with different actions. This was indicated in the annotation files by adding the tag “multiple action scene”. Each violent segment is annotated at frame level, i.e., it is defined by its starting and ending video frame numbers.

Seven visual and three audio concepts are provided: *presence of blood, fights, presence of fire, presence of guns, presence of cold weapons, car chases and gory scenes* (for the video modality); *presence of screams, gunshots and explosions* (for the audio modality). Participants should note that they are welcome to carry out detection of the high-level concepts themselves. However, concept detection is not the goal of the task and these high-level concept annotations are only provided for training purposes and only on the training set. For the video concepts, each of them follows the same annotation format as for violent segments, i.e., starting and ending frame numbers and possibly some additional tags. Regarding blood annotations, a proportion of the amount of blood in each segment is provided by the following tags: unnoticeable, low, medium and high. Four different types of fights are annotated: only two people fighting, a small group of people (roughly less than 10), large group of people (more than 10), distant attack (i.e., no real fight but somebody is shot or attacked at distance). As for the presence of fire, anything from big fires and explosions to fire coming out of a gun while shooting, a candle, a cigarette lighter, a cigarette, or sparks was annotated, e.g., a space shuttle taking off also generates fire and thus receives a fire label. An additional tag may indicate special colors of the fire (i.e., not yellow or orange). If a segment of video showed the presence of firearms (or cold weapons) it was annotated by any type of (parts of) guns (or cold weapons) or assimilated arms. By “cold weapon”, we mean any weapon that does not involve fire or explosions as a result from the use of gun powder or other explosive materials. Annotations of gory scenes are more delicate. In the present task, they are indicated by graphic images of bloodletting and/or tissue damage. This includes horror or war representations. As this is also a subjective and difficult notion to define, some additional segments showing really disgusting mutants or creatures are annotated as gore. In this case, additional tags describing the event/scene are added. For the audio concepts, each temporal segment is annotated with its starting and ending times in seconds, and an additional tag corresponding to the type of event, chosen from the list: *nothing, gunshot, canon fire, scream, scream effort, explosion, multiple actions, multiple actions canon fire, multiple actions scream effort*. Automatically generated shot boundaries with their corresponding key frames are also provided with each movie. Shot segmentation was carried out by Technicolor’s software.

## 5. RUN DESCRIPTION

Participants can submit four types of runs: two of them are shot-classification runs and the others are segment-level runs. For the two shot-classification runs, participants are required to provide violent scene detection at the shot level, according to the provided shot boundaries. Each shot has to be classified as violent or non violent, with a confidence score. These two runs will differ in the data that can be used for the classification: for the first one, only the content of the movie extractable from the DVDs is allowed for feature

extraction, whereas in the second one, additional external data (e.g., extracted from the web) can be used. For the two segment-level runs, participants are required to, independently of shot boundaries, provide violent segments for each test movie. Once again, confidence scores should be added for each segment. Similarly to the shot-level runs, the two segment-level runs differ from the type of data allowed for the classification: internal data from the DVDs only vs. internal data plus additional external data. In all cases, confidence scores are compulsory, as they will be used for the evaluation metric. They will also allow to plot detection error trade-off curves which should be of great interest to analyze and compare the different techniques. For both subtasks, i.e., both violence definitions, the required run will be the run at shot-level without external data.

As a first step towards a qualitative evaluation, participants are encouraged to present at the MediaEval workshop a video summary of the most violent scenes found by their algorithms. This will not be evaluated by the organizers this year, but it will serve as a first basis for future evolution of the task.

## 6. EVALUATION CRITERIA

As in 2012, the official evaluation metric will be the mean average precision at the  $N$  top ranked violent shots. Several performance measures will be used for diagnostic purposes (false alarm and miss detection rates, AED-precision and recall as defined in [4], the MediaEval cost, which is a function weighting false alarms (FA) and missed detections (MI), etc.). To avoid only evaluating systems at given operating points and enable full comparison of the pros and cons of each system, we will use detection error trade-off (DET) curves, plotting  $P_{fa}$  as a function of  $P_{miss}$  given a segmentation and a score for each segment, where the higher the score, the more likely the violence.  $P_{fa}$  and  $P_{miss}$  are respectively the FA and MI rates given the system’s output and the reference annotation. In the shot classification, the FA and MI rates were calculated on a per shot basis while, in the segment level run, they were computed on a per unit of time basis, i.e., durations of both references and detected segments are compared. Note that in the segment level run, DET curves are possible only for systems returning a dense segmentation (a list of segments that spans the entire video). Segments not in the output list will be considered as non violent for all thresholds.

## 7. REFERENCES

- [1] B. Ionescu, J. Schlüter, I. Mironica, and M. Schedl. A naive mid-level concept-based fusion approach to violence detection in hollywood movies. In *ICMR*, pages 215–222, 2013.
- [2] C. Penet, C.-H. Demarty, G. Gravier, and P. Gros. Multimodal Information Fusion and Temporal Integration for Violence Detection in Movies. In *ICASSP*, Kyoto, Japon, 2012.
- [3] F. D. M. d. Souza, G. C. Chavez, E. A. d. Valle Jr., and A. d. A. Araujo. Violence detection in video using spatio-temporal features. In *SIBGRAPI '10*, pages 224–230, Washington, DC, USA, 2010.
- [4] A. Temko, C. Nadeu, and J.-I. Biel. Acoustic Event Detection: SVM-Based System and Evaluation Setup in CLEAR’07. In *Multimodal Technologies for Perception of Humans*, pages 354–363. 2008.